# Genomic variation and evolution of Clostridium difficile



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This dissertation is submitted for the degree of Doctor of Philosophy

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### **Declaration**

This dissertation describes my work undertaken at the Wellcome Trust Sanger Institute between May 2008 and September 2011, under the supervision of Profs. Gordon Dougan and Julian Parkhill in fulfilment of the requirements for the degree of Doctor of Philosophy, at Darwin College, University of Cambridge. This dissertation is identical to that which was examined, except as required by the examiners by way of correction.

This thesis is the result of my own work and includes nothing which is the outcome of work done in collaboration, except where indicated in the text. The work described here has not been submitted for a degree, diploma or any other qualification at any other university or institution. I confirm that this dissertation does not exceed the page limit specified by the Biology Degree Committee.

Miao He

Cambridge, September 2011

#### **Abstract**

#### Genomic variation and evolution of *Clostridium difficile*

Miao He

Clostridium difficile has rapidly emerged, in part through the transcontinental spread of various PCR ribotypes including 001, 017, 027 and 078, as the leading cause of antibiotic-associated diarrheal disease in humans. In particular, a previously rare ribotype 027 was recognized as the underlying cause of a number of hospital outbreaks worldwide. However, the genetic basis of the emergence of *C. difficile* as a human pathogen is unclear.

In this thesis, comparative genomic analysis was used to identify genetic variation within the *C. difficile* population and to further understand the evolution of this organism. Genome comparison between isolates belonging to different ribotypes revealed *C. difficile* is a genetically diverse species, which is estimated to have evolved within the last 1.1–85 million years. Disease-causing isolates have arisen from multiple lineages, suggesting that virulence can evolve independently. Horizontal gene transfer and large-scale recombination of core genes have shaped the *C. difficile* genome over both short and long time scales.

Ribotype 027 isolates have a highly similar genomic backbone. To understand the genetic characteristics driving the emergence of this group and identify the genetic relationships between pre-epidemic and recent 027s, whole genome sequencing was applied to a global collection of 339 isolates spanning 25 years. Phylogenetic analysis based on SNPs identified within the core genome discriminated between >100 distinct genotypes and identified two distinct epidemic lineages that have acquired fluoroquinolone resistance independently. One of these lineages has spread more widely and contains descendants from Canada, the USA, the UK, and Australia. Further antibiotic resistance mutations and potential signatures of immune selection were also identified. Strikingly, even among these isolates, which share a highly similar core genome, there is evidence that large-scale homologous recombination and horizontal gene transfer are significant.

The global collection also included >100 ribotype 027 isolates sampled from the same English hospital and the associated patient capture areas. Phylogenetic analysis was used to distinguish relapse from re-infection cases within this particular sample set. Additionally, by combining temporal and spatial data, the use of genetic variation analysis to study local hospital transmission was explored.

### **Publications**

Publications associated with the work described in this thesis:

**He, M.**, Miyajima F., *et al.* Two independent fluoroquinolone-resistant lineages of epidemic *Clostridium difficile* 027/BI/NAP1 emerged in North America and spread globally. Submitted.

Castillo-Ramirez, S., Harris, S.R., Holden, M.T., **He, M.**, Parkhill, J., Bentley, S.D., and Feil, E.J. (2011). The impact of recombination on dN/dS within recently emerged bacterial clones. PLoS Pathog 7, e1002129.

**He, M**., Sebaihia, M., Lawley, T.D., Stabler, R.A., Dawson, L.F., Martin, M.J., Holt, K.E., Seth-Smith, H.M., Quail, M.A., Rance, R., *et al.* (2010). Evolutionary dynamics of *Clostridium difficile* over short and long time scales. Proc Natl Acad Sci U S A 107, 7527-7532.

Stabler, R.A., Valiente, E., Dawson, L.F., **He, M.**, Parkhill, J., and Wren, B.W. (2010). In-depth genetic analysis of *Clostridium difficile* PCR-ribotype 027 strains reveals high genome fluidity including point mutations and inversions. Gut Microbes 1, 269-276.

Stabler, R.A., **He, M**., Dawson, L., Martin, M., Valiente, E., Corton, C., Lawley, T.D., Sebaihia, M., Quail, M.A., Rose, G., *et al.* (2009). Comparative genome and phenotypic analysis of *Clostridium difficile* 027 strains provides insight into the evolution of a hypervirulent bacterium. Genome Biol 10, R102.

Croucher NJ, Fookes MC, Perkins TT, Turner DJ, Marguerat SB, Keane T, Quail MA, **He M**, Assefa S, Bähler J, Kingsley RA, Parkhill J, Bentley SD, Dougan G, Thomson NR. (2009) A simple method for directional transcriptome sequencing using Illumina technology. Nucleic Acids Res. 37(22):e148.

Perkins TT, Kingsley RA, Fookes MC, Gardner PP, James KD, Yu L, Assefa SA, **He M**, Croucher NJ, Pickard DJ, Maskell DJ, Parkhill J, Choudhary J, Thomson NR, Dougan G. (2009) A strand-specific RNA-Seq analysis of the transcriptome of the typhoid bacillus *Salmonella typhi*. PLoS Genet. 5(7):e1000569.

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I am very thankful to Dr. Trevor Lawley for numerous discussions on *C. difficile*, and for generously sharing his time and expertise. The mouse colonization experiment was conducted by Drs. Trevor Lawley and Simon Clare. It is also through Dr. Lawley's effort in obtaining a comprehensive strain collection that I was able to carry out the study of global BI/NAP1/027 microevolution.

I am hugely indebted to WTSI sequencing and finishing teams. Michael Quail, Richard Rance, David Harris, Elizabeth Gibson, Craig and Nicola Corton, Hilary Browne, Graham Rose, Karen Brooks, Christine Burrows, Louise Clark, Vicky Murray, Scott Thurston, Andries van Tonder, and Danielle Walker have all participated in generating the data used for this analysis. I thank all of them very much.

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### To my parents

"The secret... I guess you've just got to find something you love to do and then... do it for the rest of your life."

## **Glossary**

ACT Artemis comparison tool

CDI C. difficile infection
CDS Coding sequence

CGH Comparative genomic hybridization

contig Contiguous sequence from overlapping reads

GA Billion years ago

GTR General time reversible substitution model

homosplasy Similarity through convergent evolution but not by descent

ICE Integrative and conjugative elements

IS Insertion sequence

JC Jukes and Cantor substitution model

MLST Multi-locus sequence typing

MLVA Multiple-locus variable-number tandem-repeat analysis

MRCA Most recent common ancestor

PFGE Pulsed-field gel electrophoresis

PMC psedomembraneous colitis

REA Restriction endonuclease analysis

RFLP Restriction fragment length polymorphism

tMRCA Time to most recent common ancestor

WTSI Wellcome Trust Sanger Institute

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